



University of  
Pittsburgh

# Algorithms and Data Structures 2

## CS 1501



Fall 2022

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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides.)

# Announcements

- Upcoming Deadlines
  - Homework 4: this Friday @ 11:59 pm
  - Lab 3: next Monday @ 11:59 pm
  - Assignment 1: Monday Oct 10<sup>th</sup> @ 11:59 pm
- **Live support session** for Assignment 1
  - Over Zoom this Friday @ 5:00 pm
- **Student Support Hours** of the teaching team are posted on the Syllabus page

# Previous lecture

- Digital Searching Problem
  - Searching when keys are represented as a sequence of digits (e.g., bits) or alphabetic characters
  - Digital Search Trees
  - Radix Search Tries

# This Lecture

- R-way Radix Search Tries
- De La Briandais (DLB) Tries

# Adding to Radix Search Trie (RST)

- Input: key and corresponding value
- if root is null, set root  $\leftarrow$  new node
- current node  $\leftarrow$  root
- for each *bit* in the key
  - if bit == 0,
    - if left child of current node is null, create a new node and attach as the left child
    - move to left child
      - either recursively or by setting current  $\leftarrow$  current.left
  - if bit == 1,
    - if right child of current node is null, create a new node and attach as the right child
    - move to right child
      - either recursively or by setting current  $\leftarrow$  current.right
- insert corresponding value into current node

# RST example

## Insert:

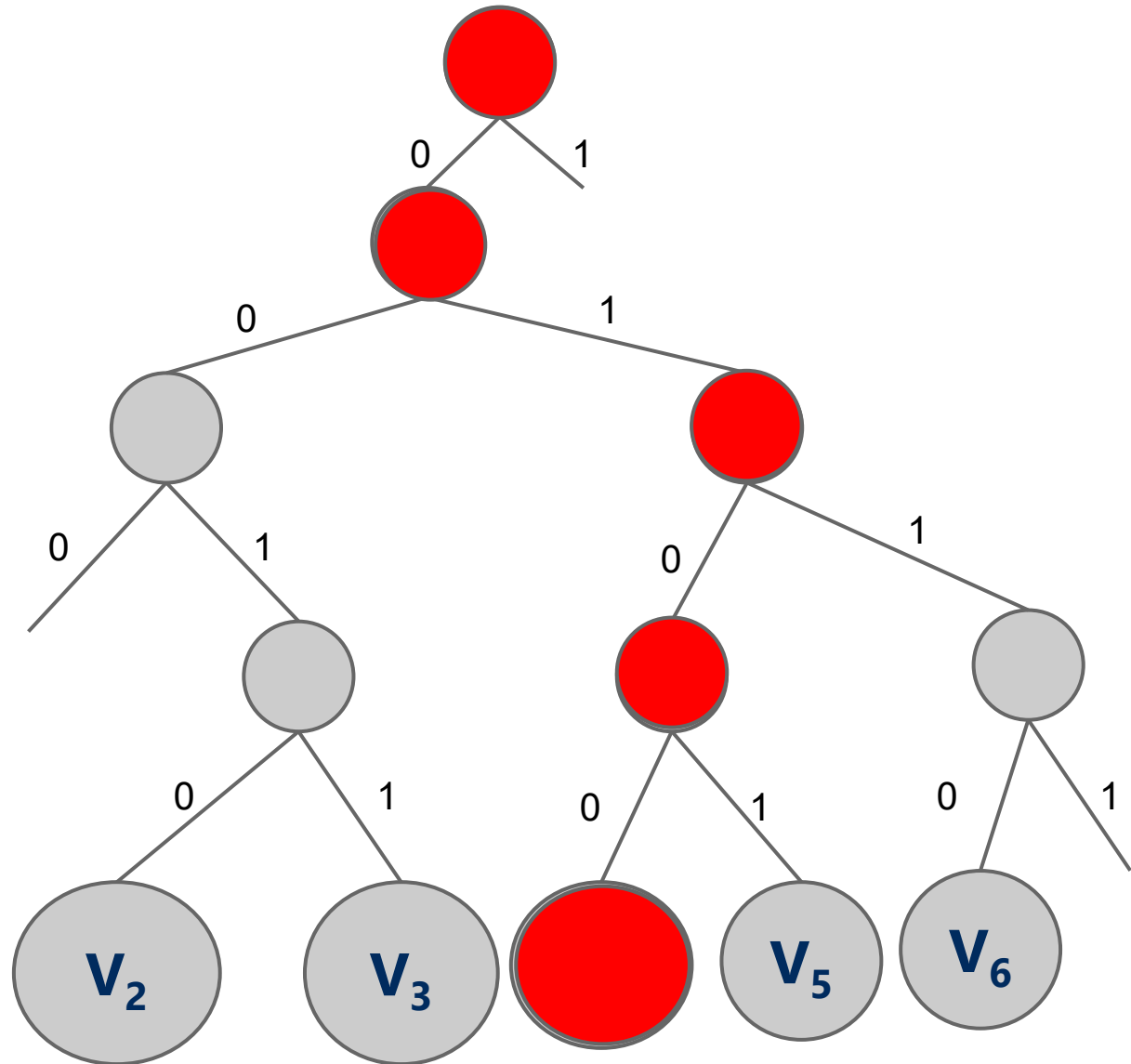
4      0100

3      0011

2      0010

6      0110

5      0101



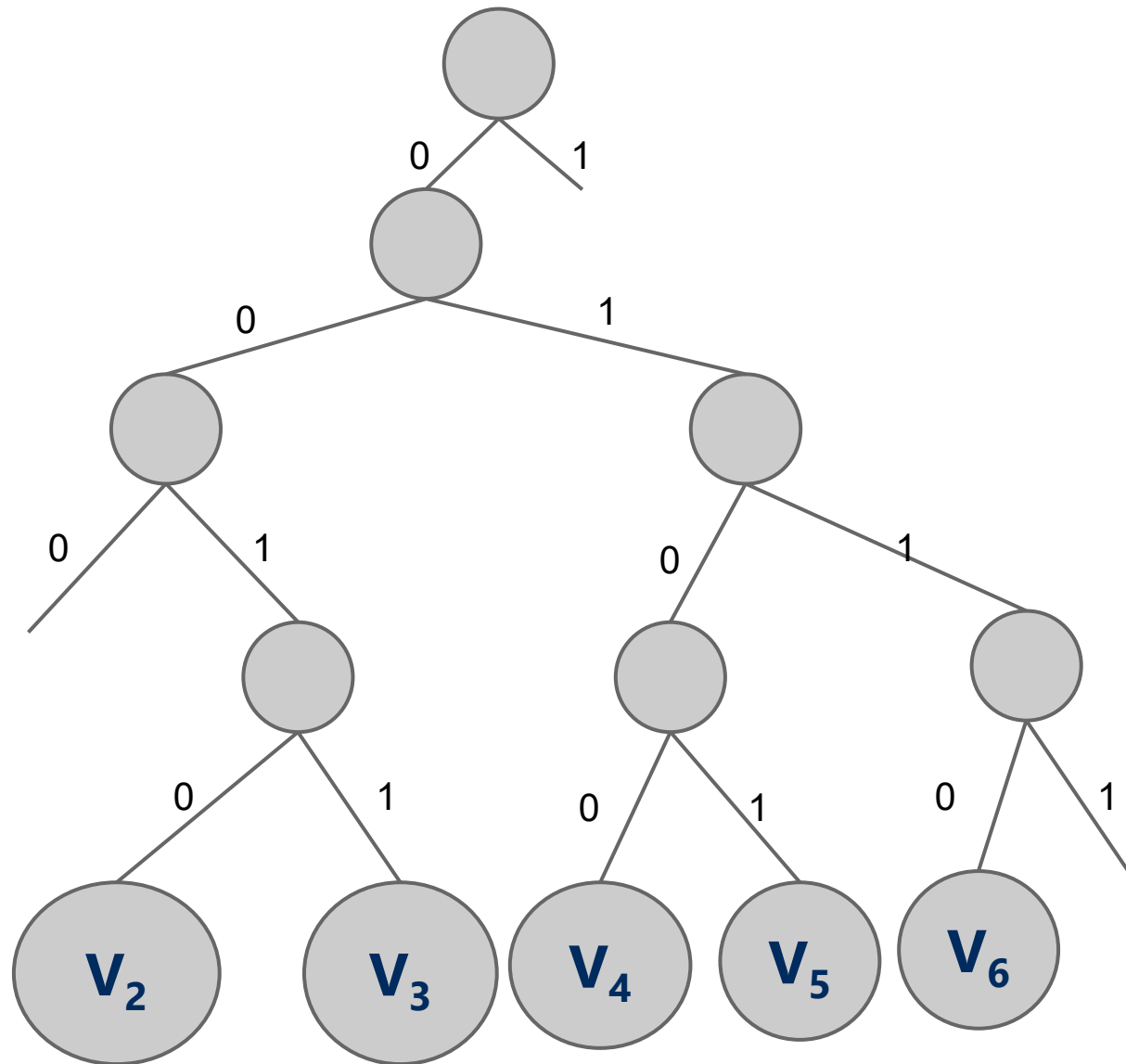
# Searching in Radix Search Trie (RST)

- Input: key
- current node  $\leftarrow$  root
- for each *bit* in the key
  - if current node is null, return *key not found*
  - if bit == 0,
    - move to left child
      - either recursively or by setting current  $\leftarrow$  current.left
  - if bit == 1,
    - move to right child
      - either recursively or by setting current  $\leftarrow$  current.right
- if current node is null or the value inside is null
  - return *key not found*
- else return the value stored in current node

# RST example

Search:

3    0011



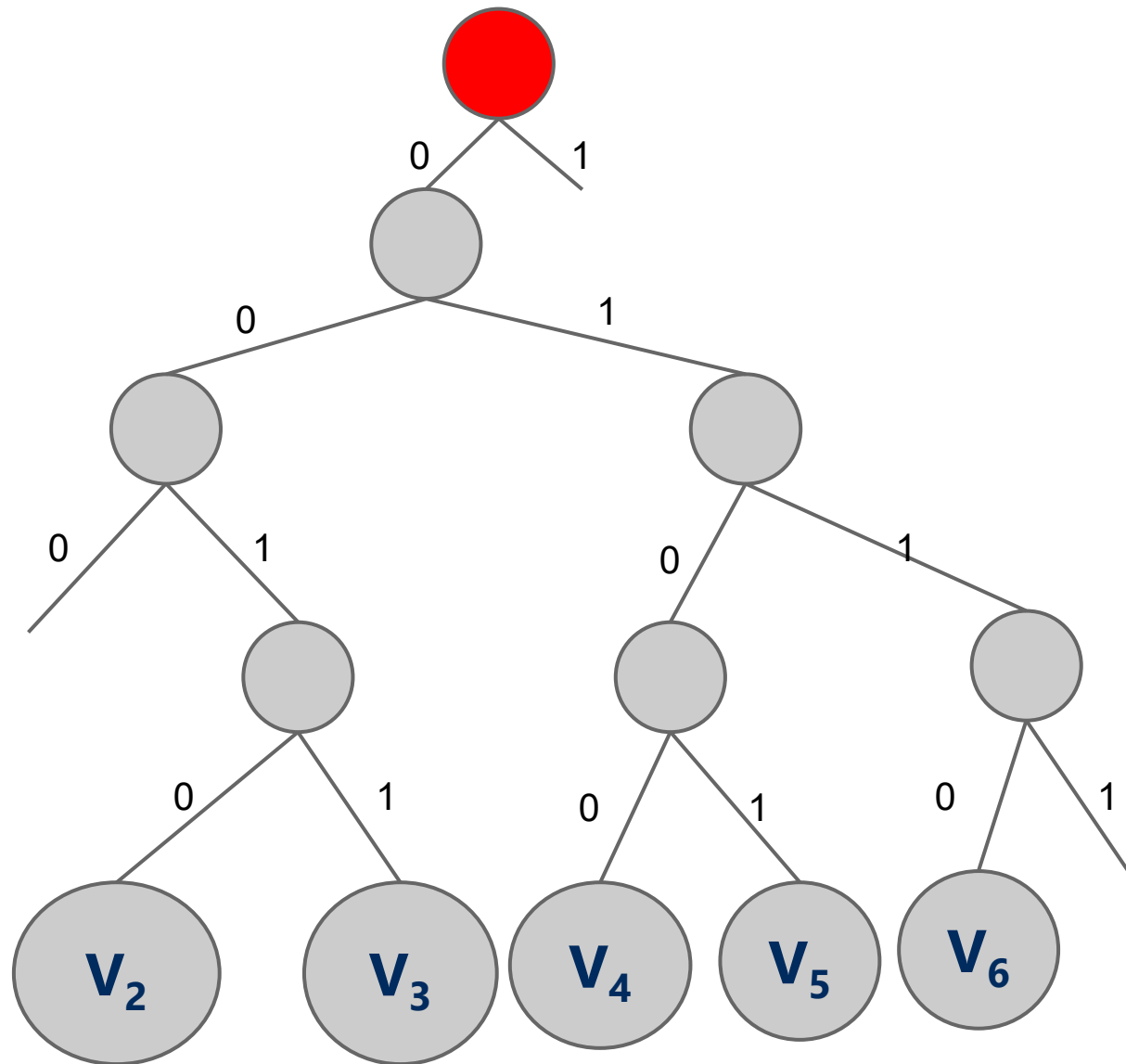


# RST example

## Search:

3      0011

7    0111



[illegible]

3      0011

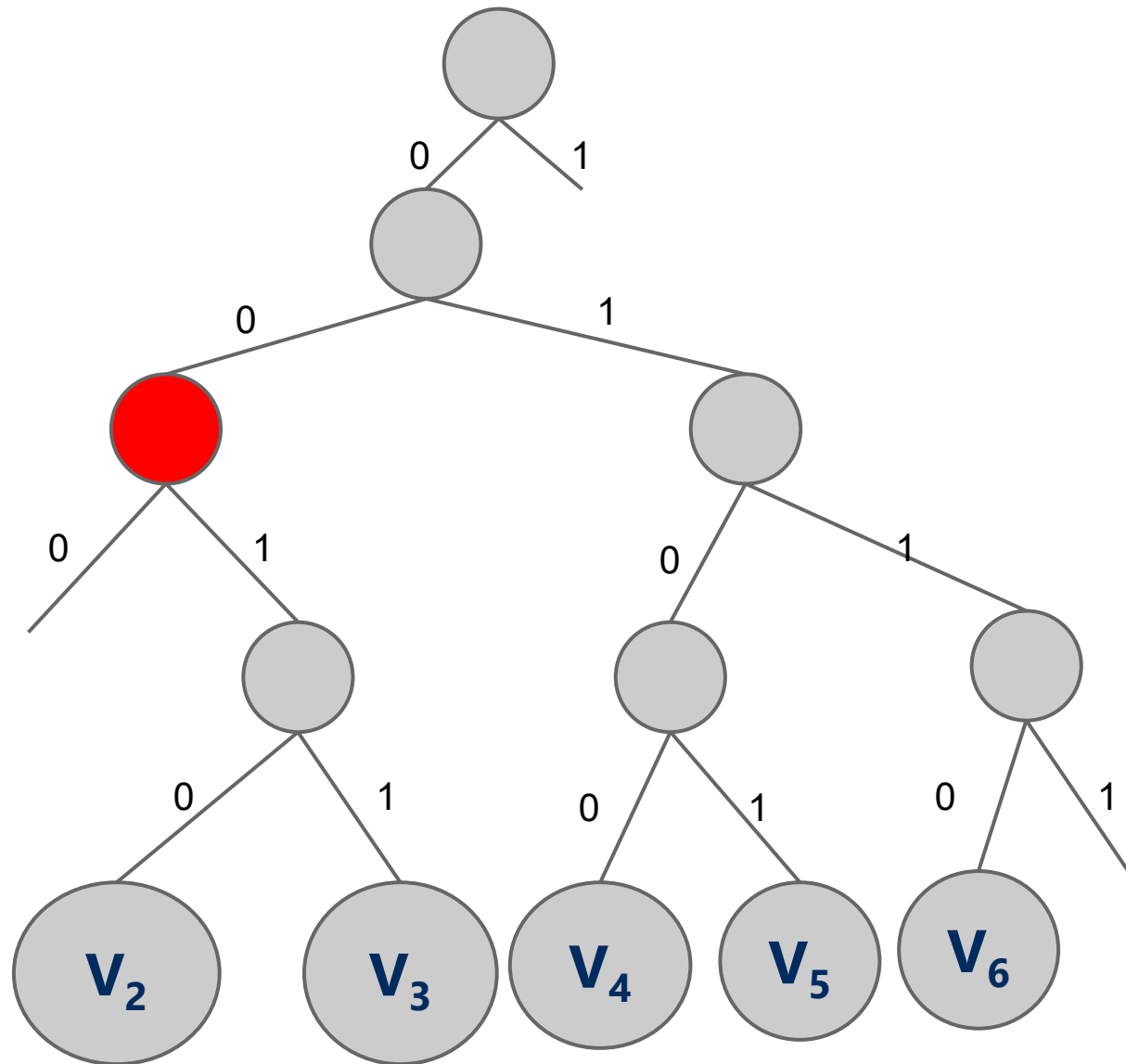
7    0111

# RST example

## Search:

3      0011

7    0111

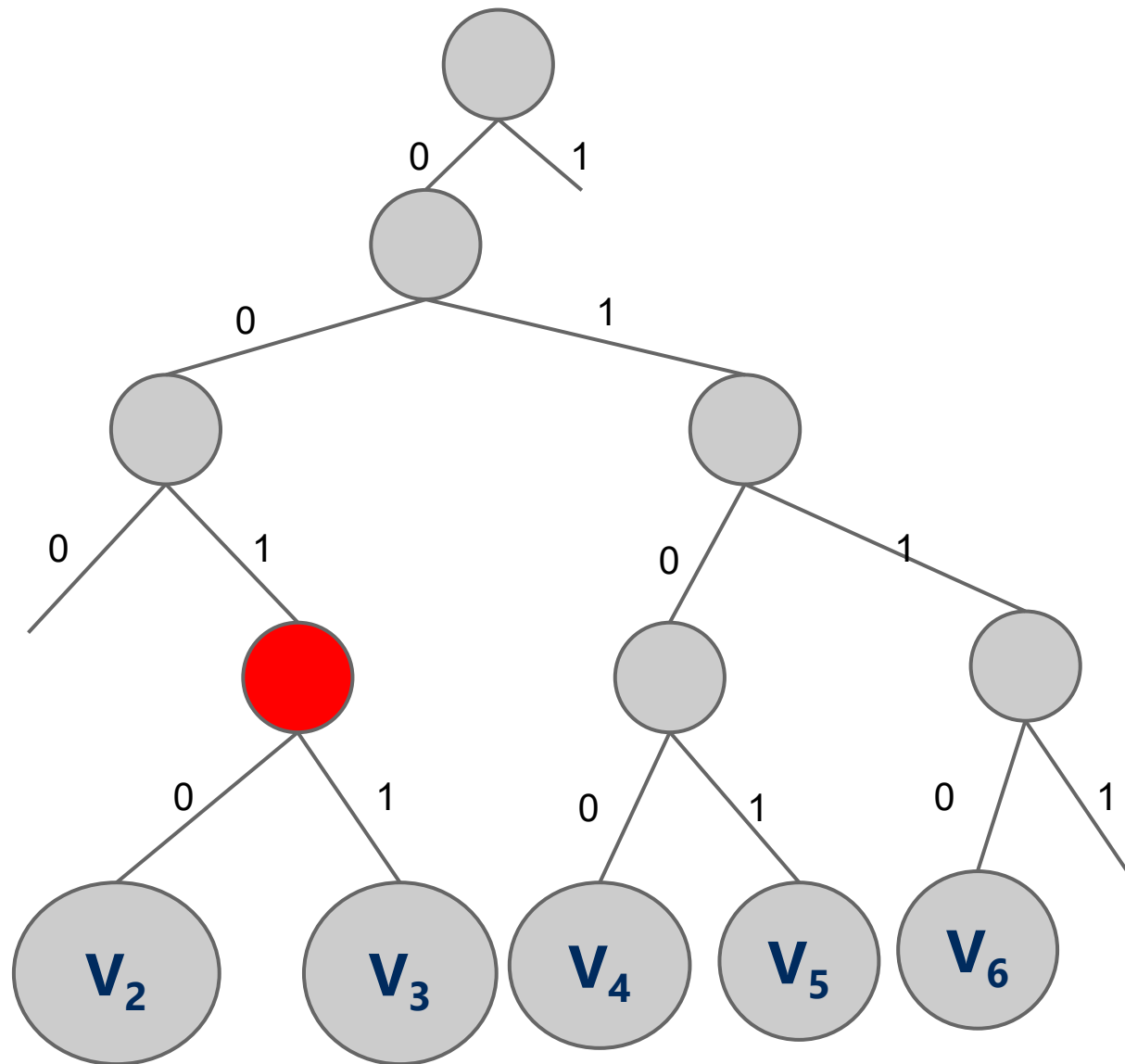


# RST example

Search:

3    001**1**

7    0111

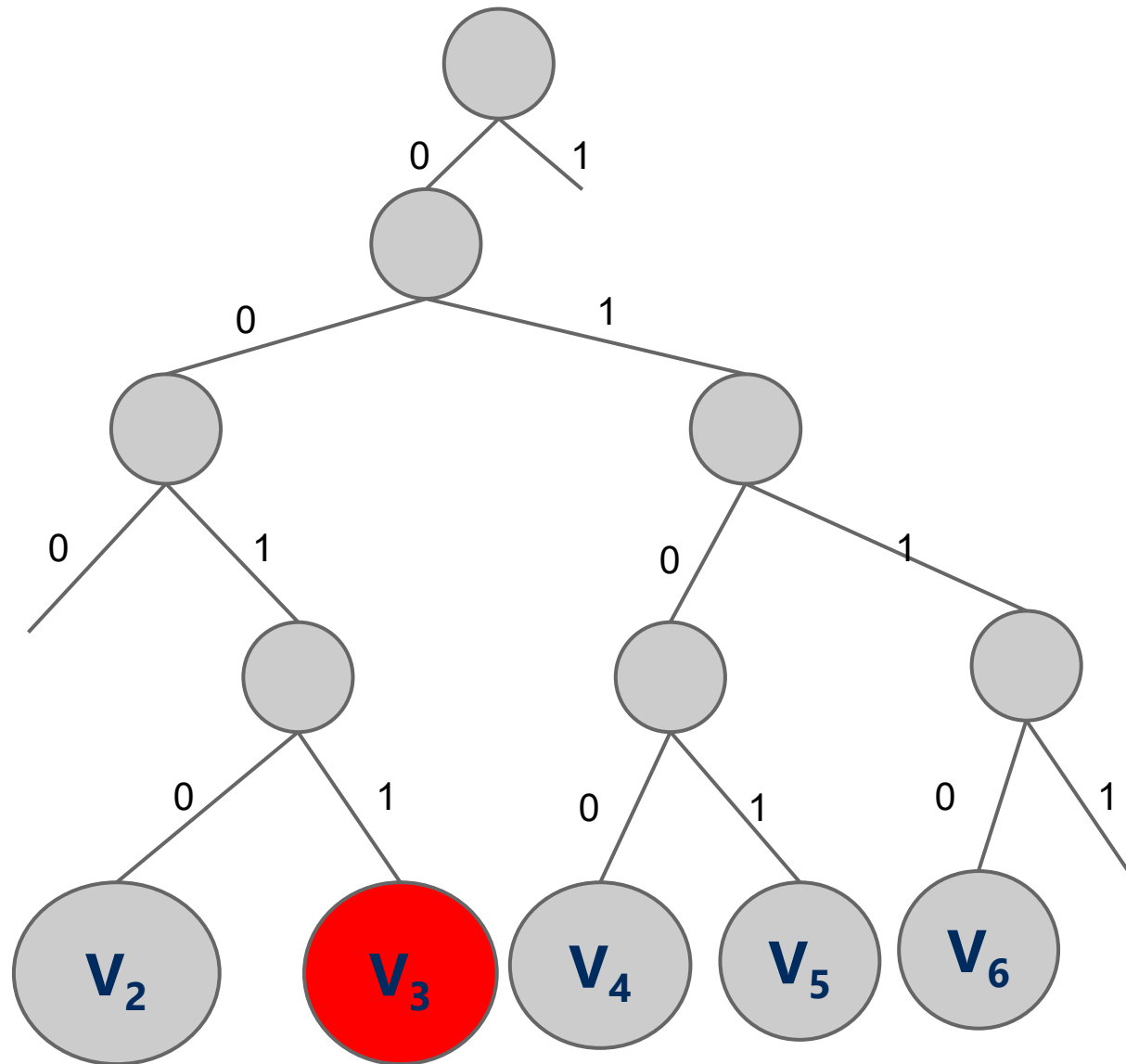


# RST example

Search:

3    0011

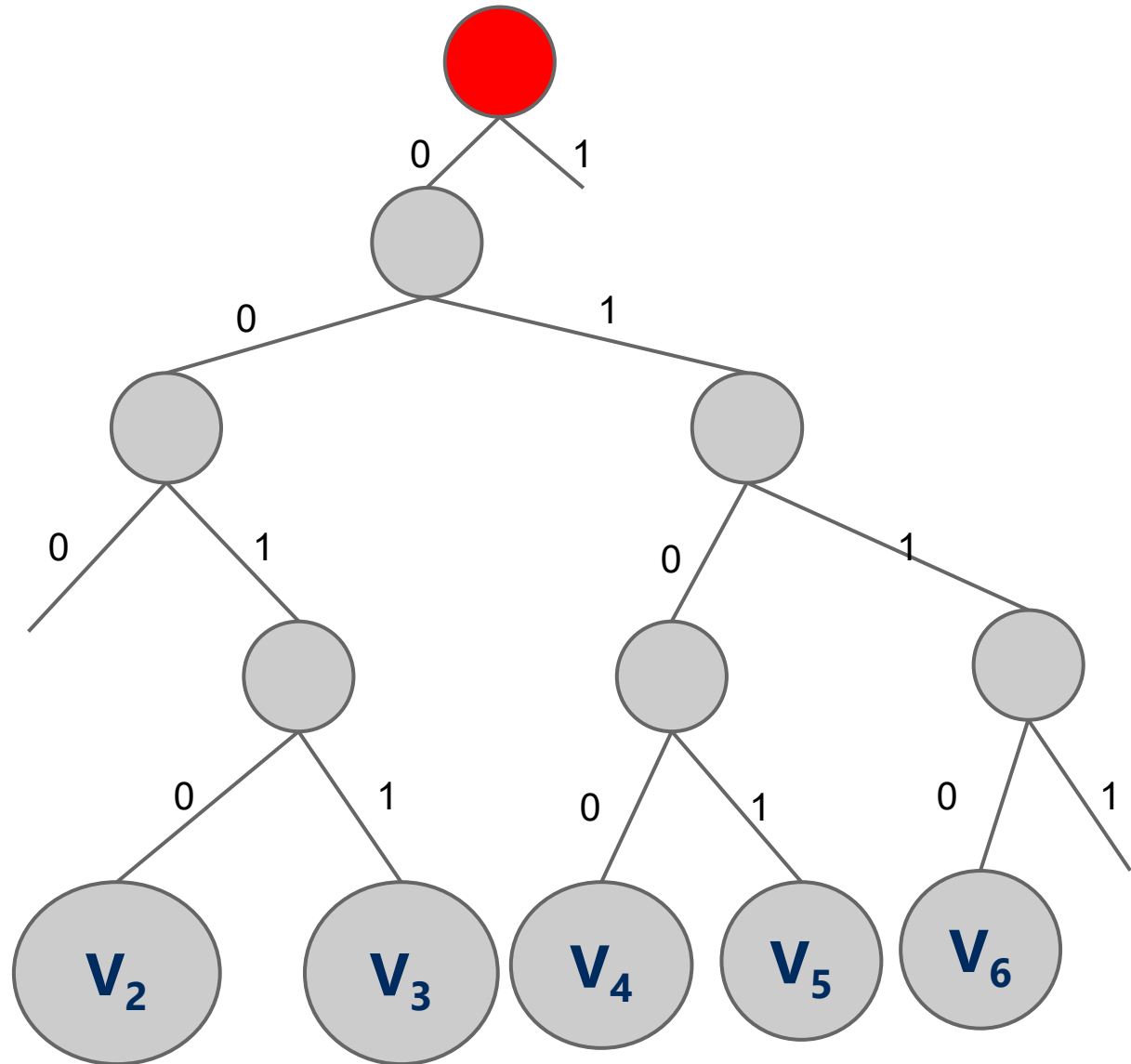
7    0111



# RST example

## Search:

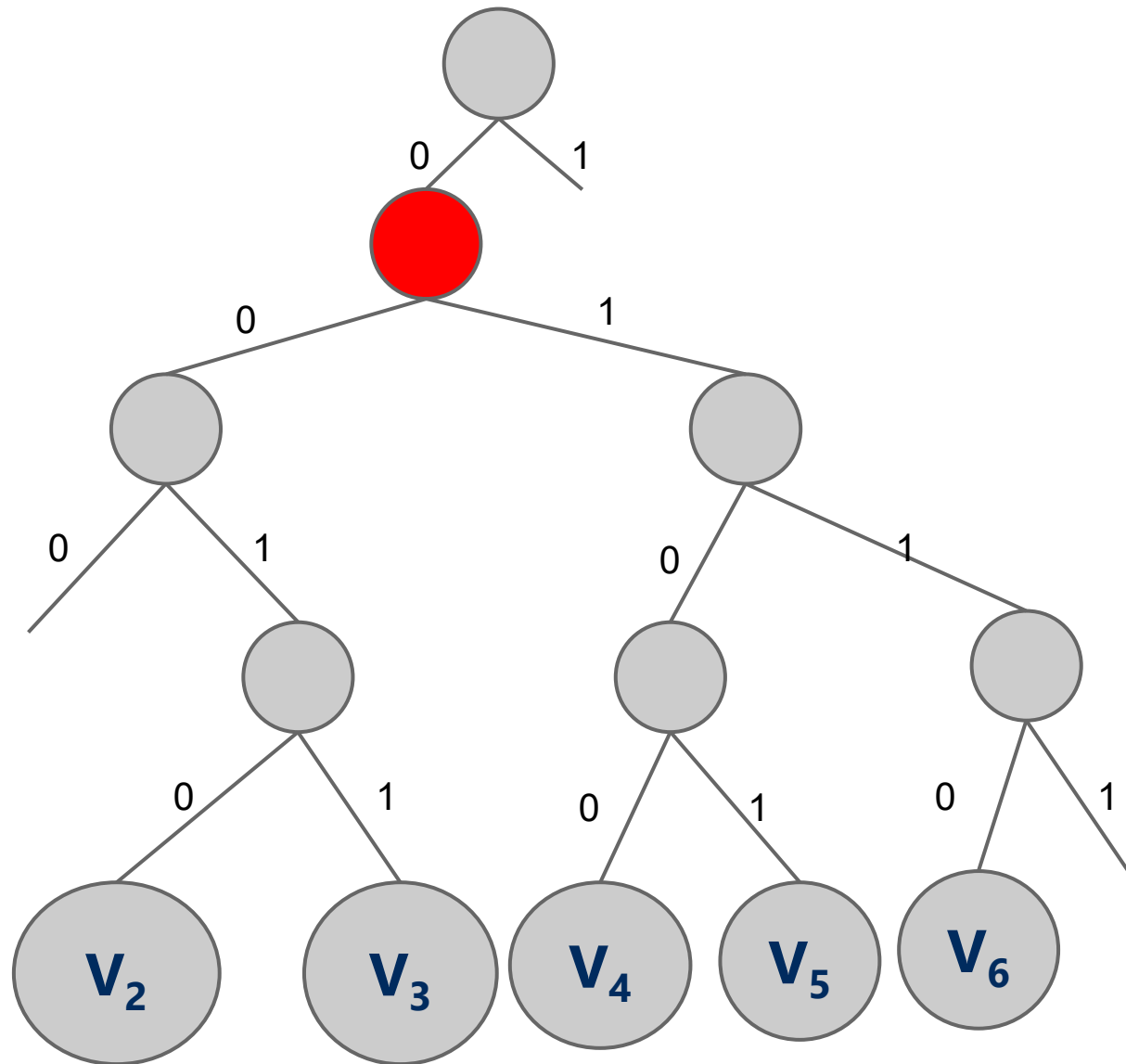
7    0111



# RST example

Search:

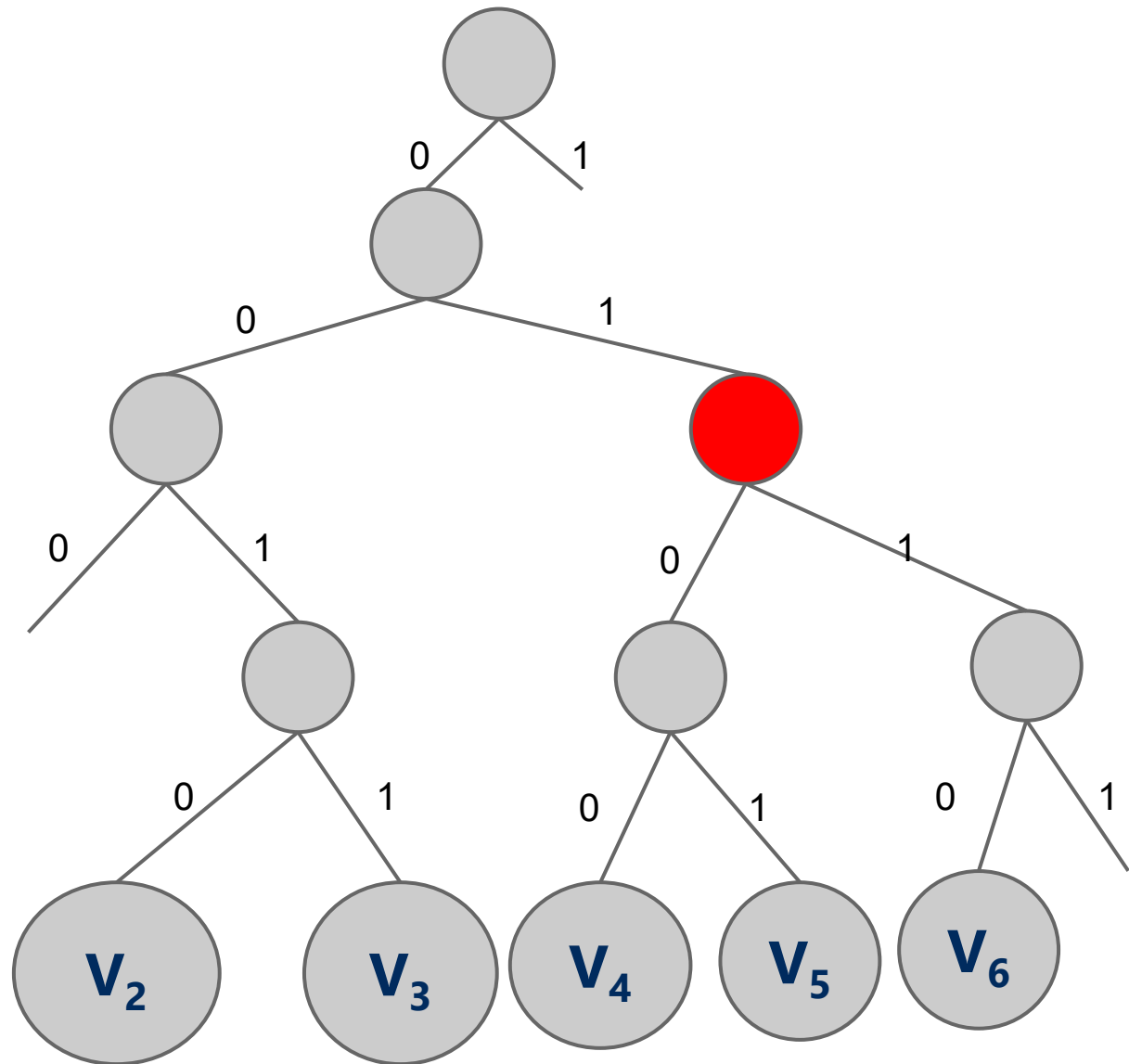
7   0**1**11



# RST example

## Search:

7    0111

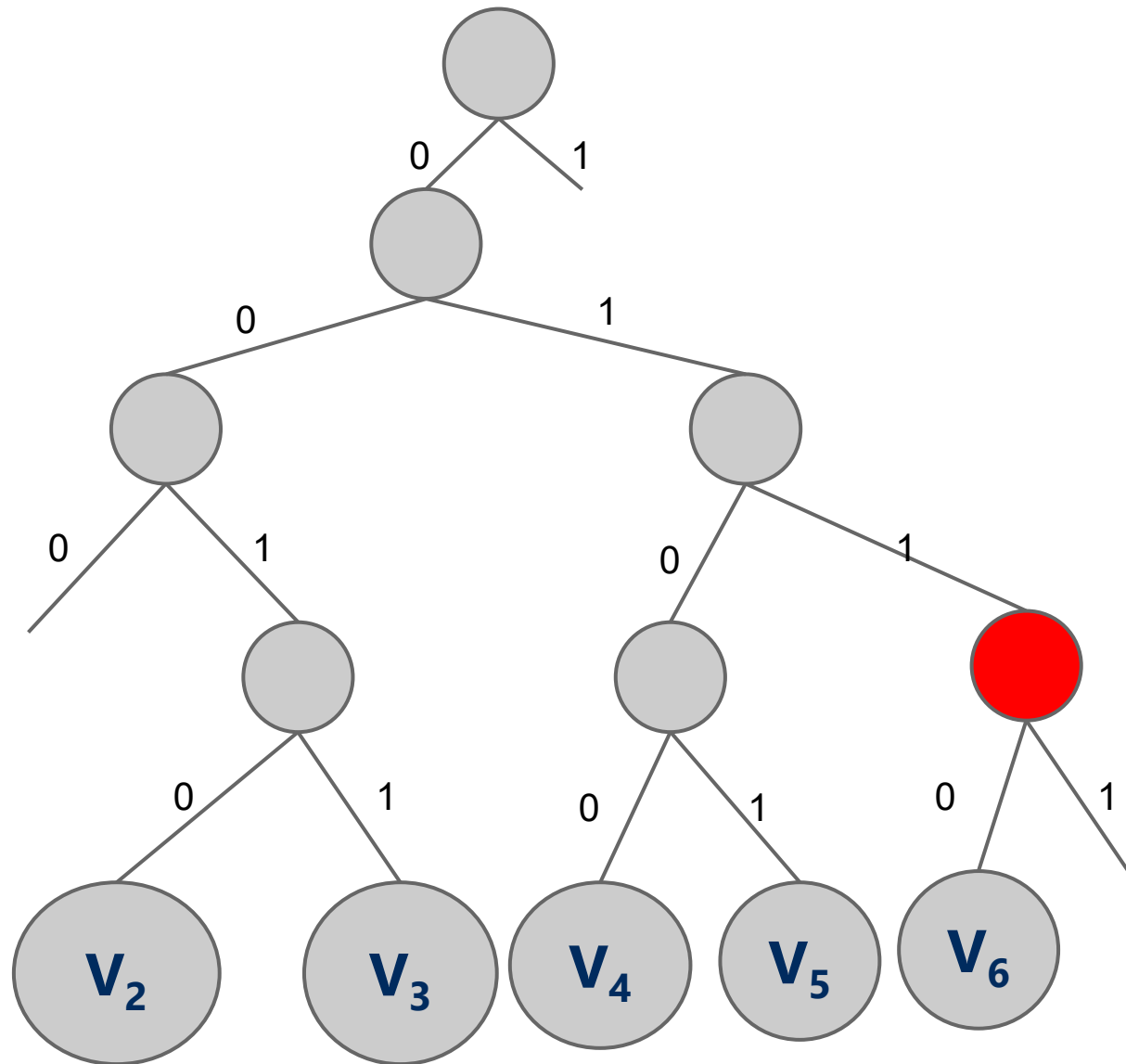




# RST example

Search:

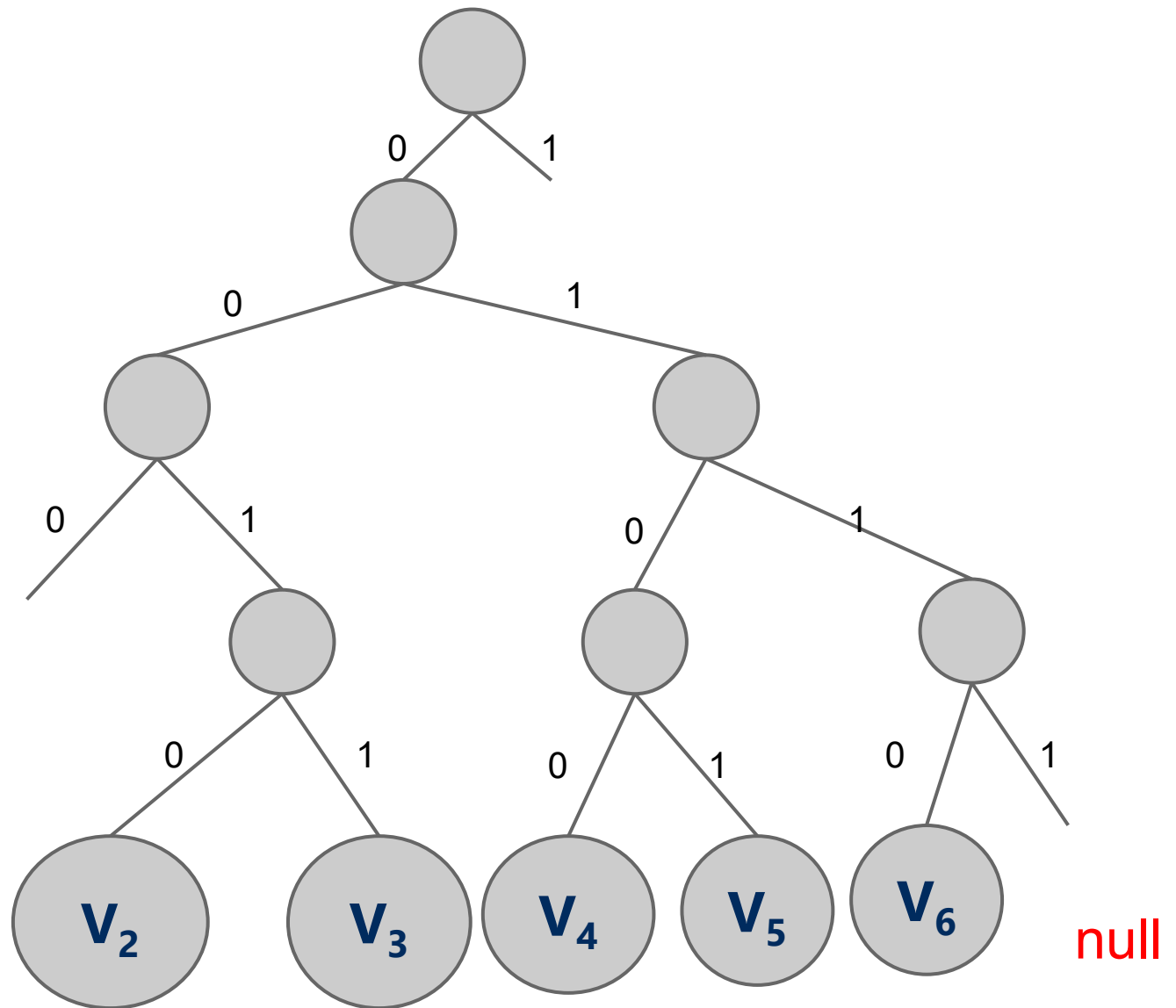
7    0111



# RST example

Search:

7    0111



# RST analysis

- Runtime?
- $O(b)$ , the bit length of the key
  - However, this time we don't have full key comparisons
- Would this structure work as well for other key data types?
- Characters?
  - Characters are the same as 8-bit ints (assuming simple ascii)
- Strings?
- May have huge bit lengths
- How to store Strings?

# Larger branching factor tries

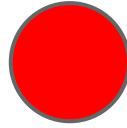
- In our binary-based Radix search trie, we considered one bit at a time
- What if we applied the same method to characters instead of bits in a string?
  - What would this new structure look like?
  - How many children per node?
    - up to  $R$  (the alphabet size)
  - Also called  $R$ -way radix search tries

# Adding to R-way Radix RST

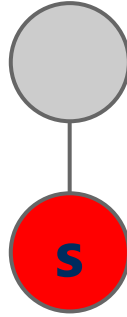
- if root is null, set root  $\leftarrow$  new node
- current node  $\leftarrow$  root
- for *each character  $c$*  in the key
  - *Find the  $cth$  child*
    - if child is null, create a new node and attach as the  $cth$  child
    - move to child
      - either recursively or by current  $\leftarrow$  child
- if at last character of key, insert value into current node

# Another trie example

she

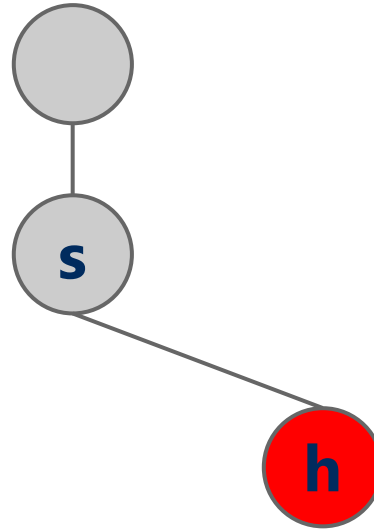


# Another trie example



she

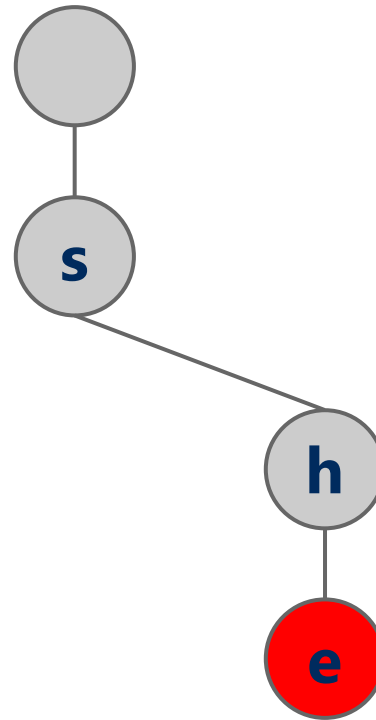
# Another trie example



she

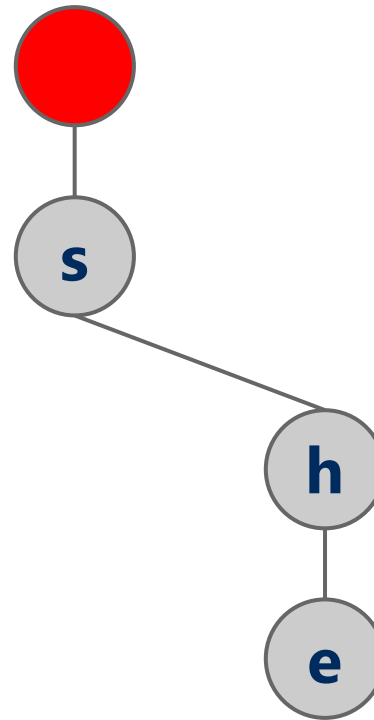


# Another trie example



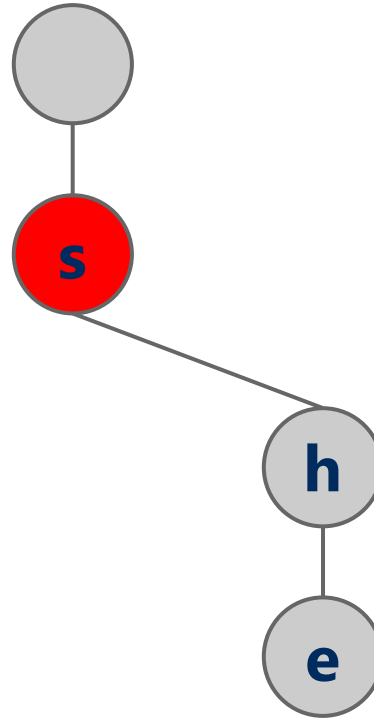
she

# Another trie example



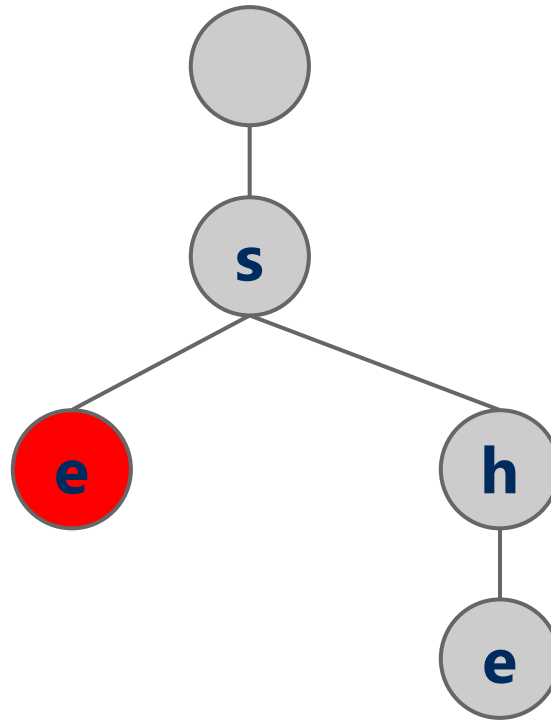
**s**ells

# Another trie example



sell

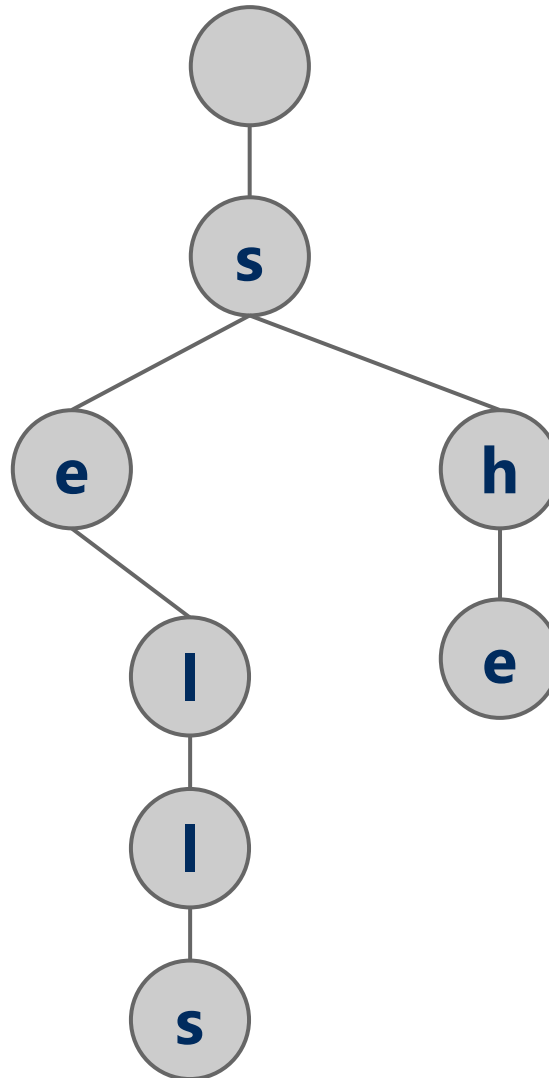
# Another trie example



se|ls

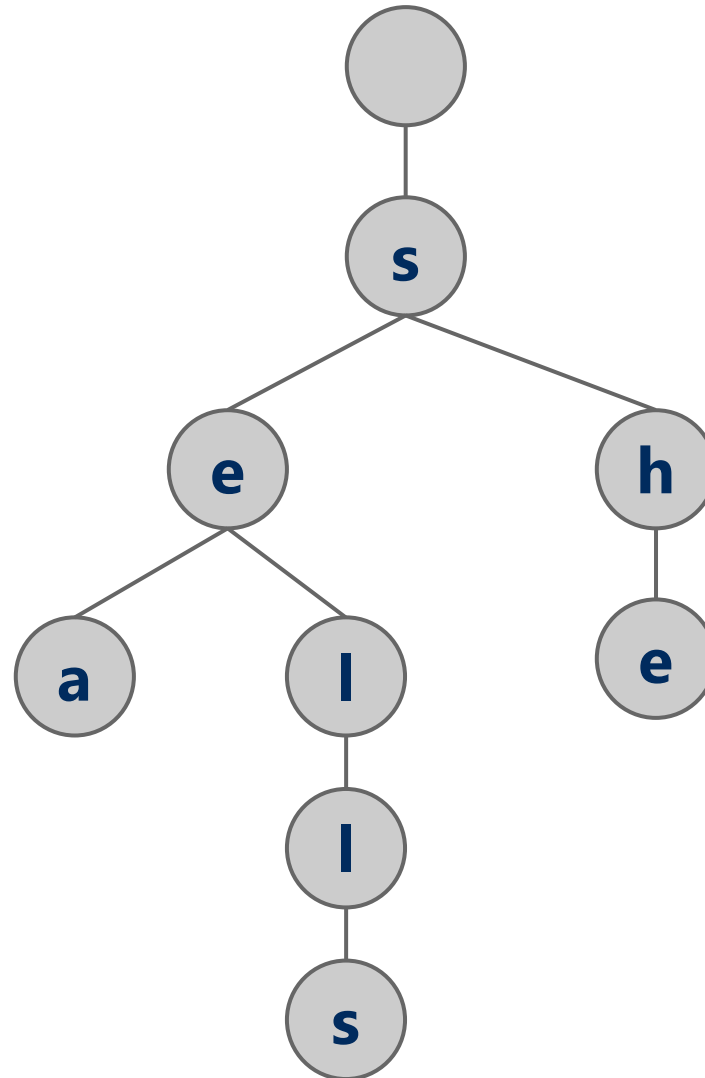
# Another trie example

sells



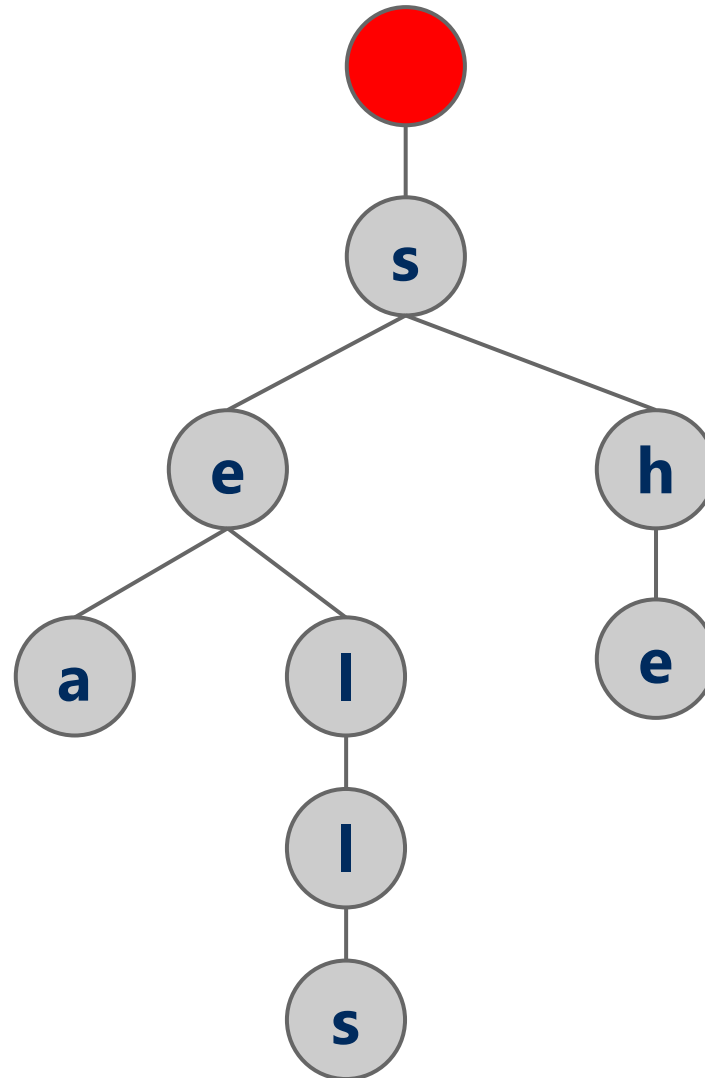
# Another trie example

sea



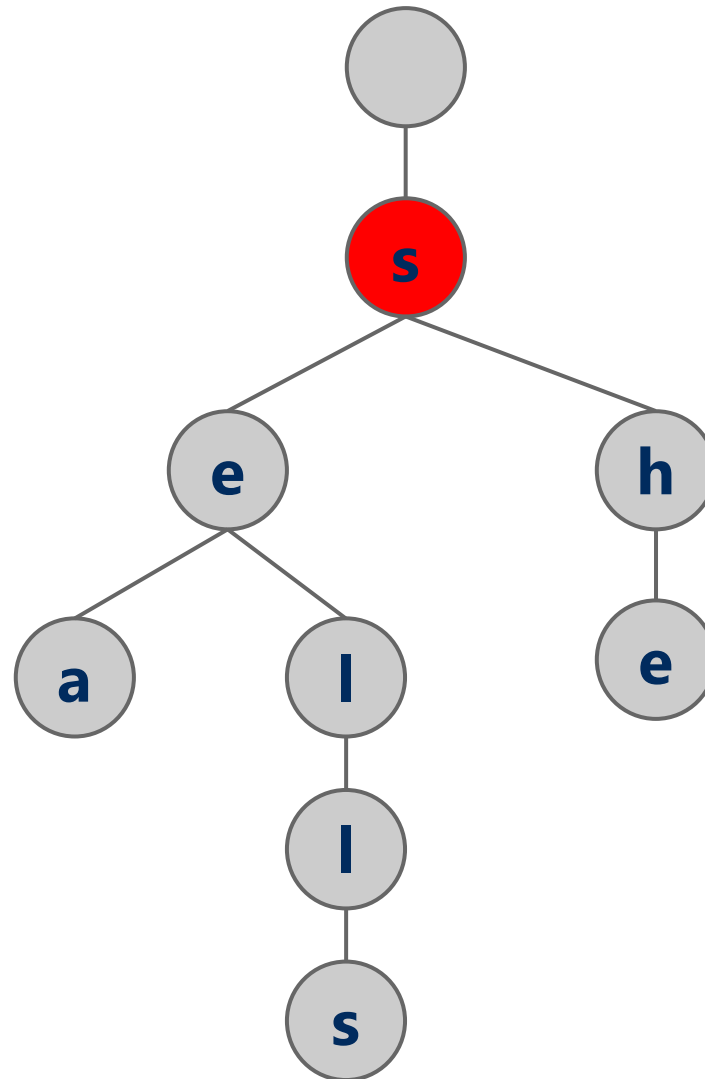
# Another trie example

**s**hells



# Another trie example

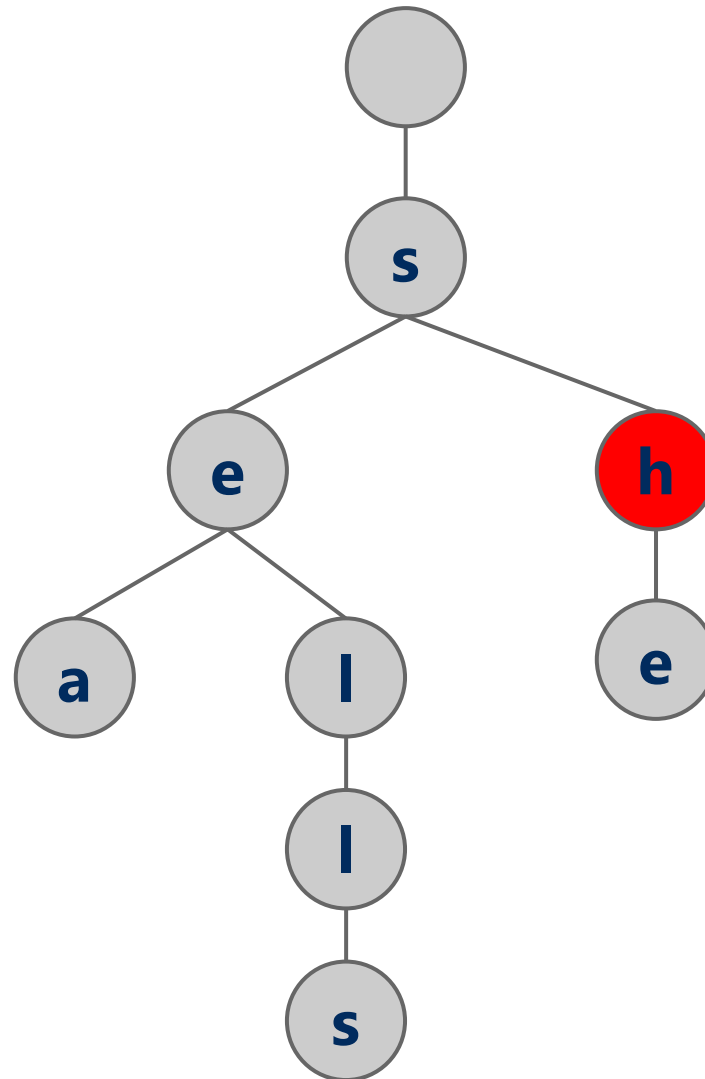
shells





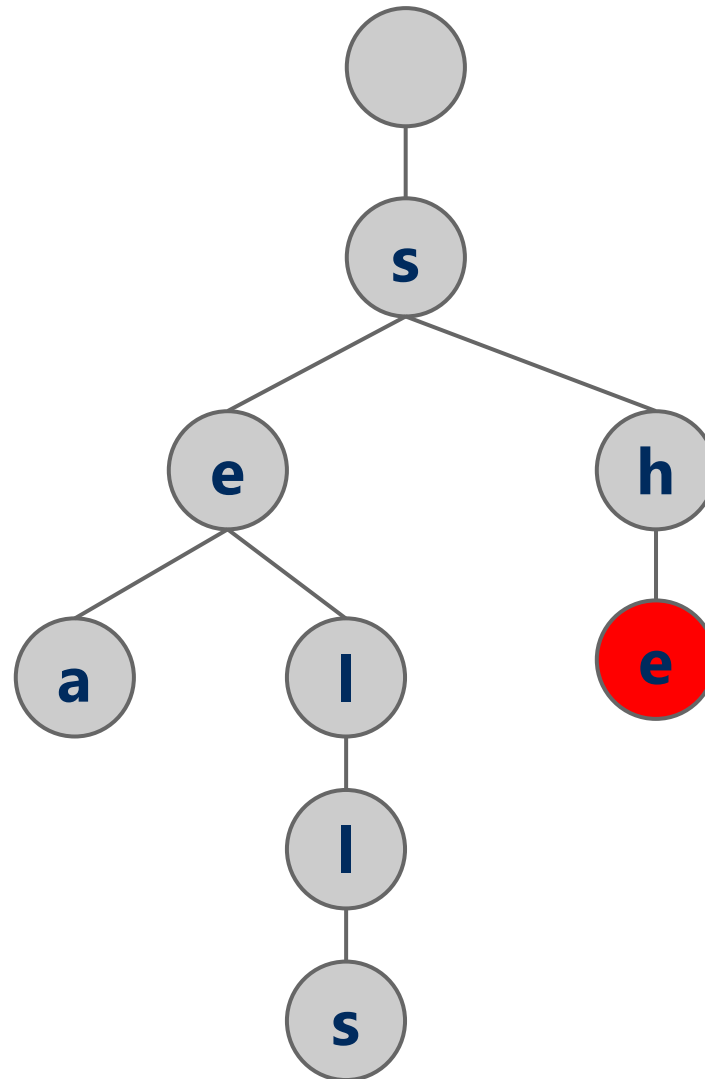
# Another trie example

shells



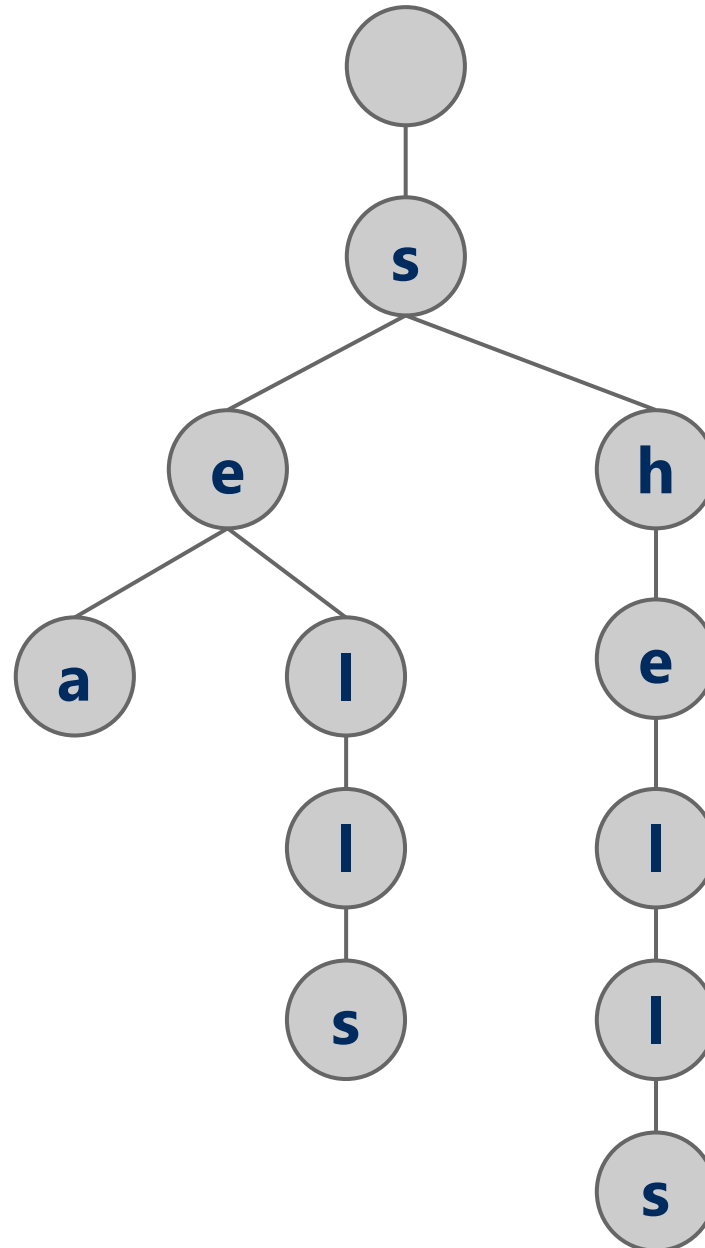
# Another trie example

shells

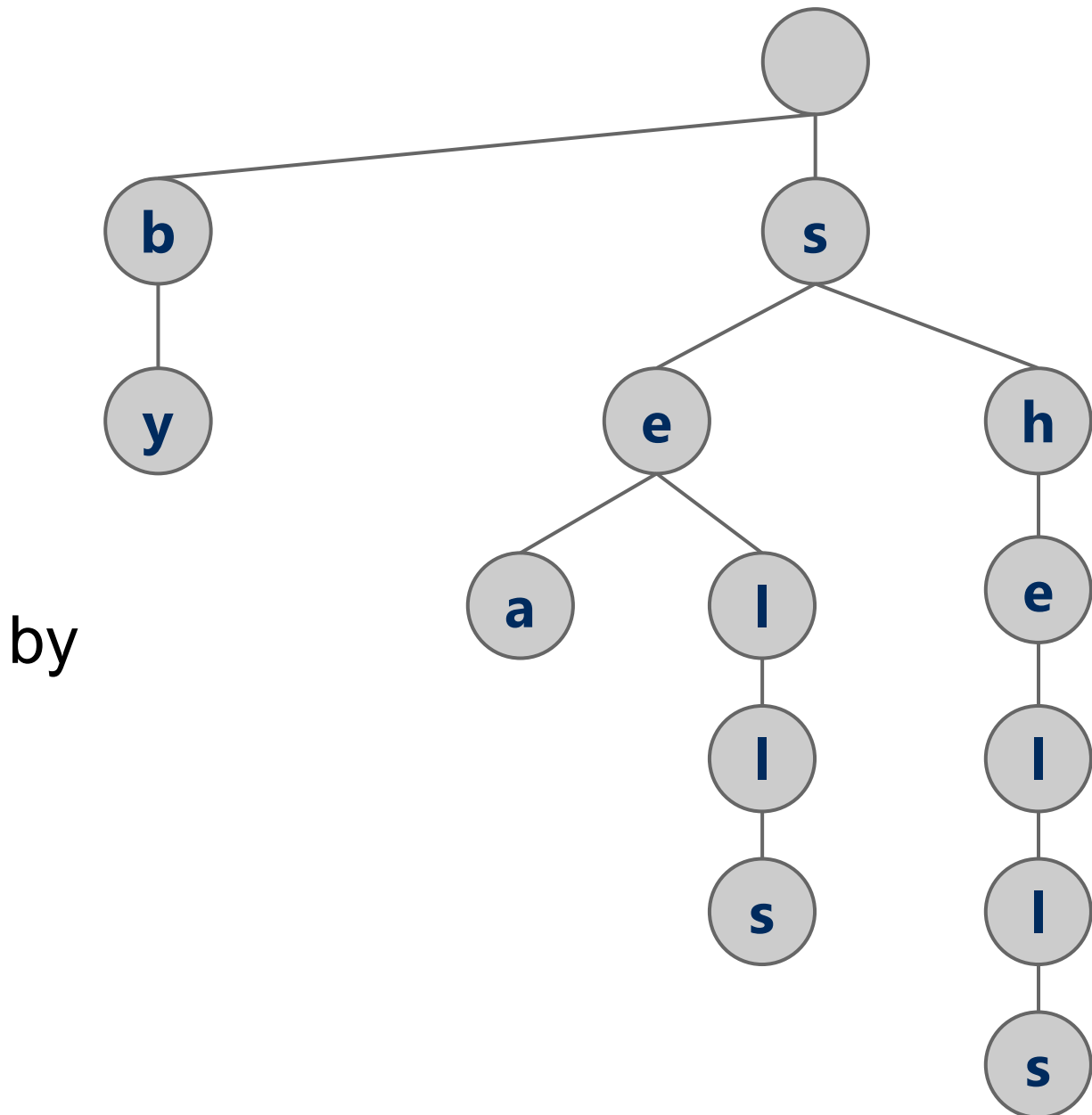


# Another trie example

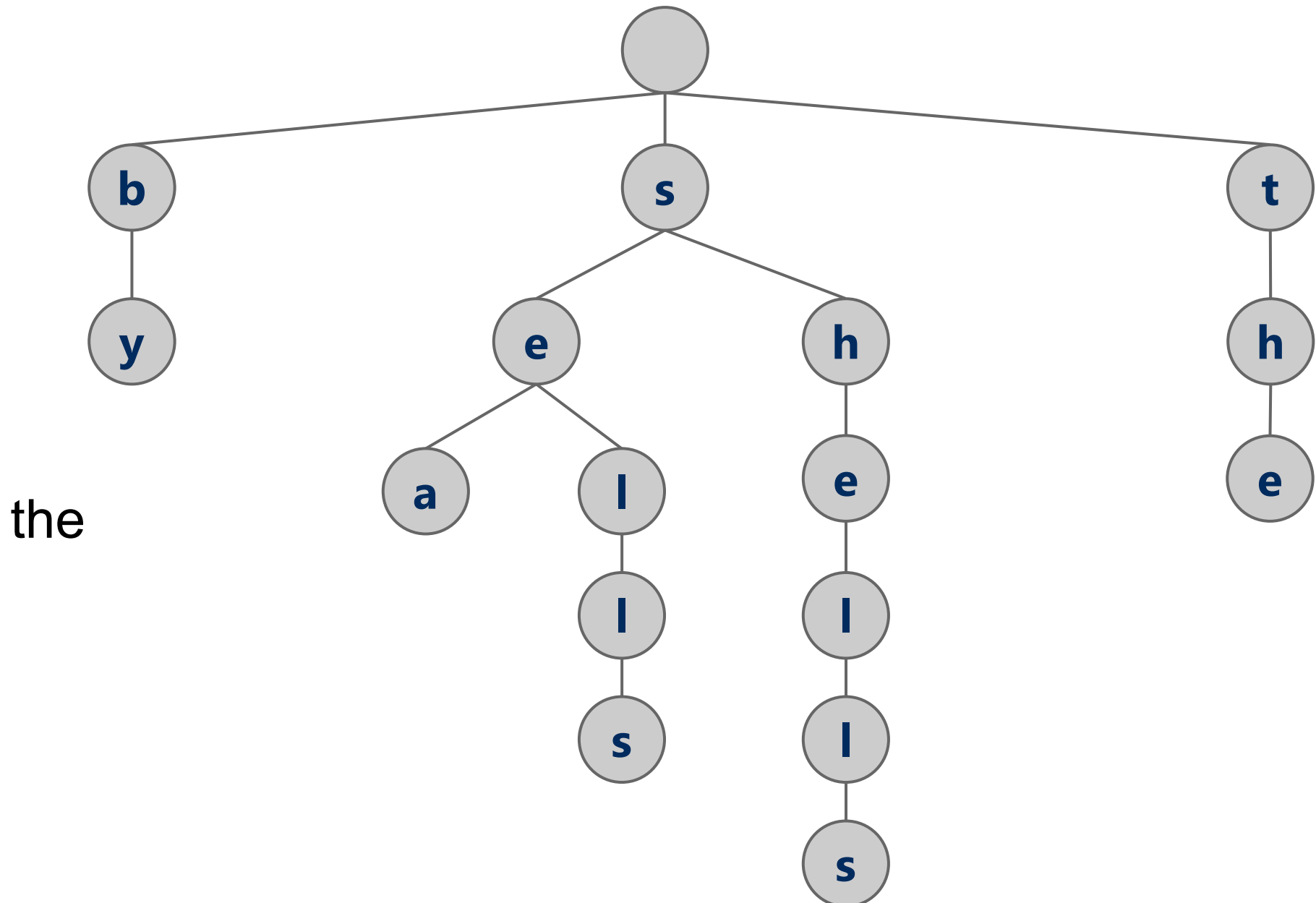
shells



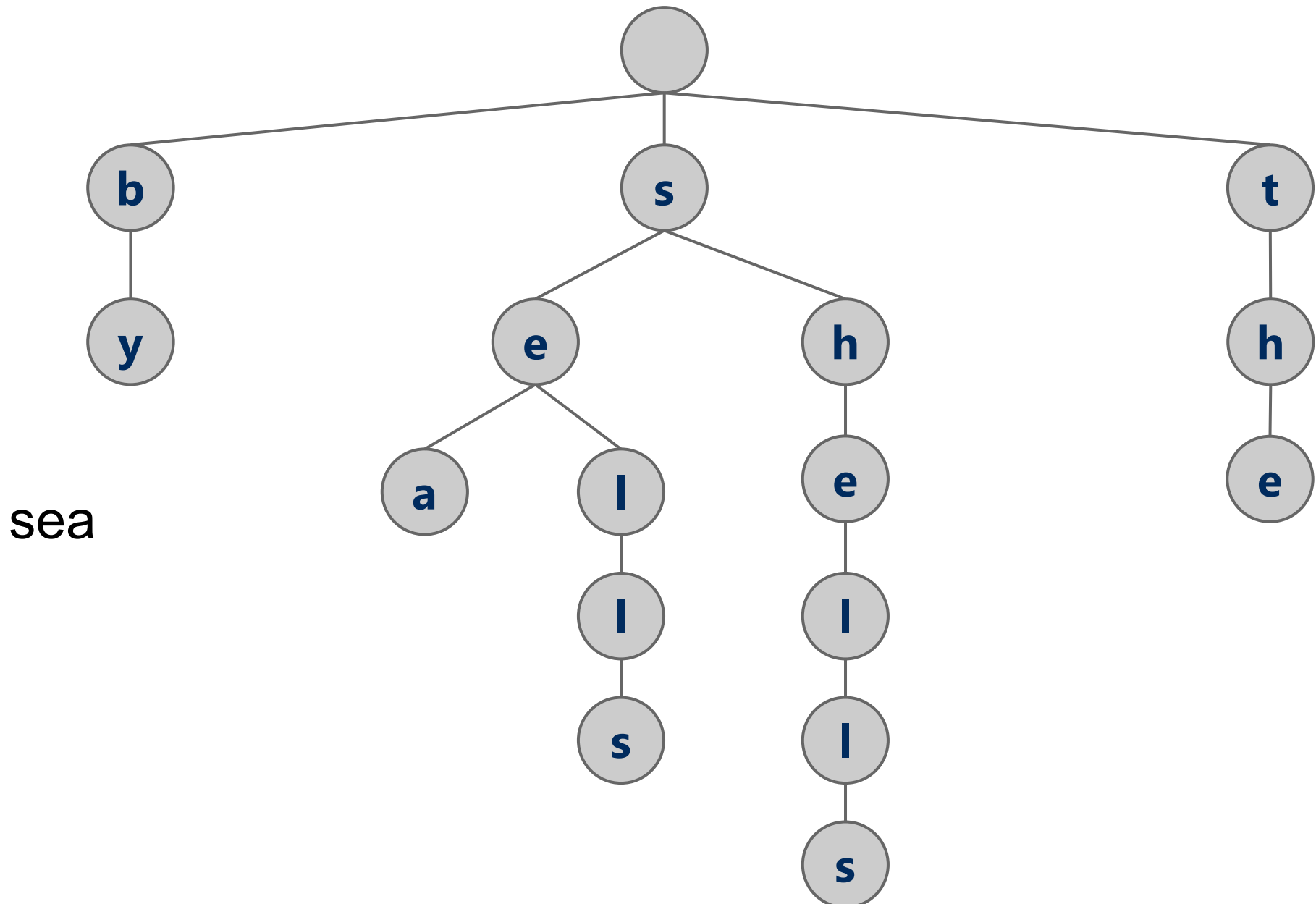
# Another trie example



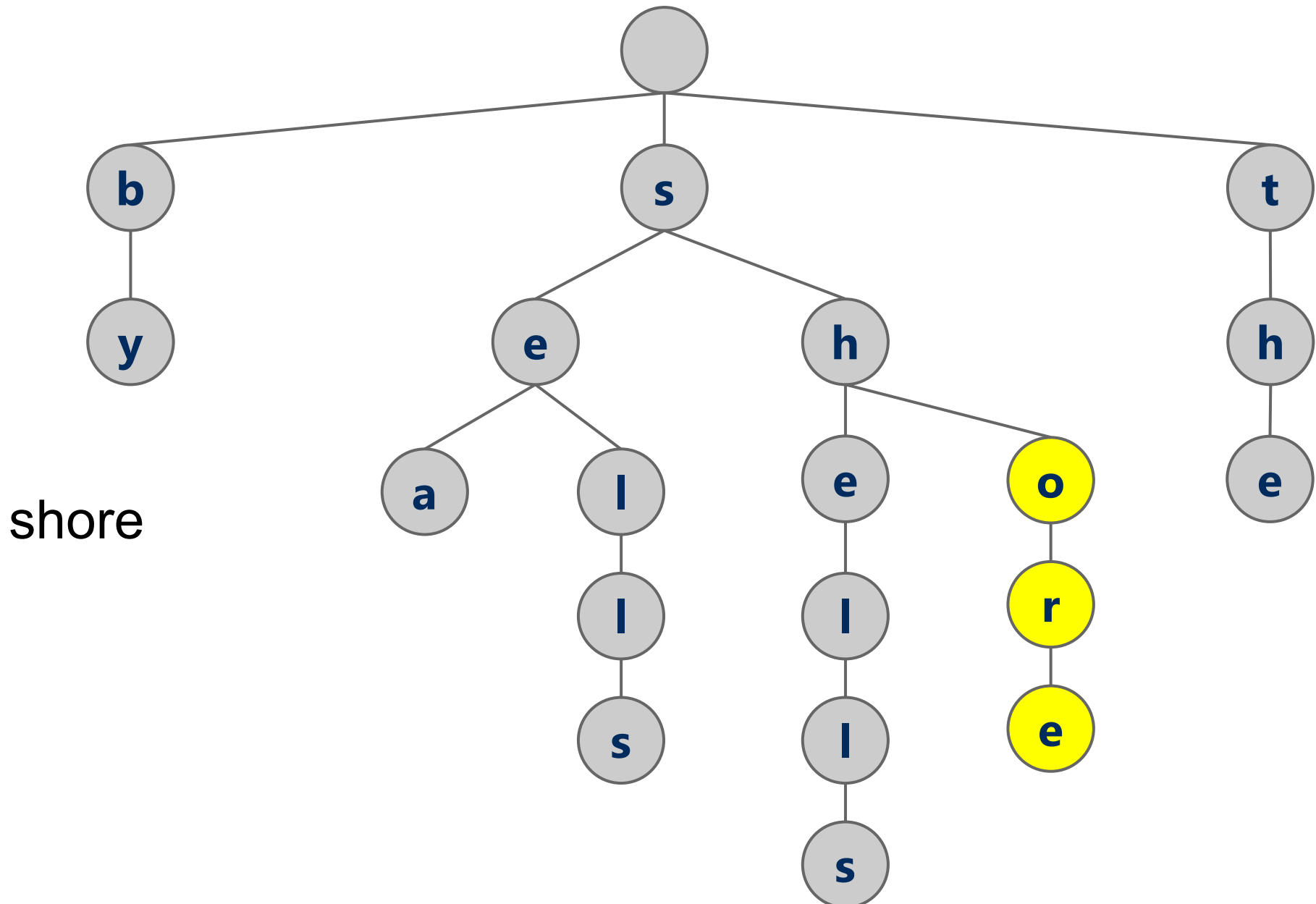
# Another trie example



# Another trie example



# Another trie example



# Analysis

- Runtime of add and *search hit*?
- $O(w)$  where  $w$  is the character length of the string
  - So, what do we gain over RSTs?

- $w < b$

- e.g., assuming fixed-size encoding

$$w = \frac{b}{\lceil \log R \rceil}$$

- tree height is reduced



# Search Miss


- Search Miss time for R-way RST
  - Require an average of  $\log_R(n)$  nodes to be examined
    - Proof in Proposition H of Section 5.2 of the text
- Average tree height with  $2^{20}$  keys in an RST?
  - $\log_2 n = \log_2 2^{20} = 20$
- With  $2^{20}$  keys in a large branching factor trie, assuming 8-bits at a time?
  - $\log_R n = \log_{256} 2^{20} = \log_{256} (2^8)^{2.5} = \log_{256} 256^{2.5} = 2.5$

# Implementation Concerns

- See TrieSt.java
  - Implements an R-way trie
- Basic node object:

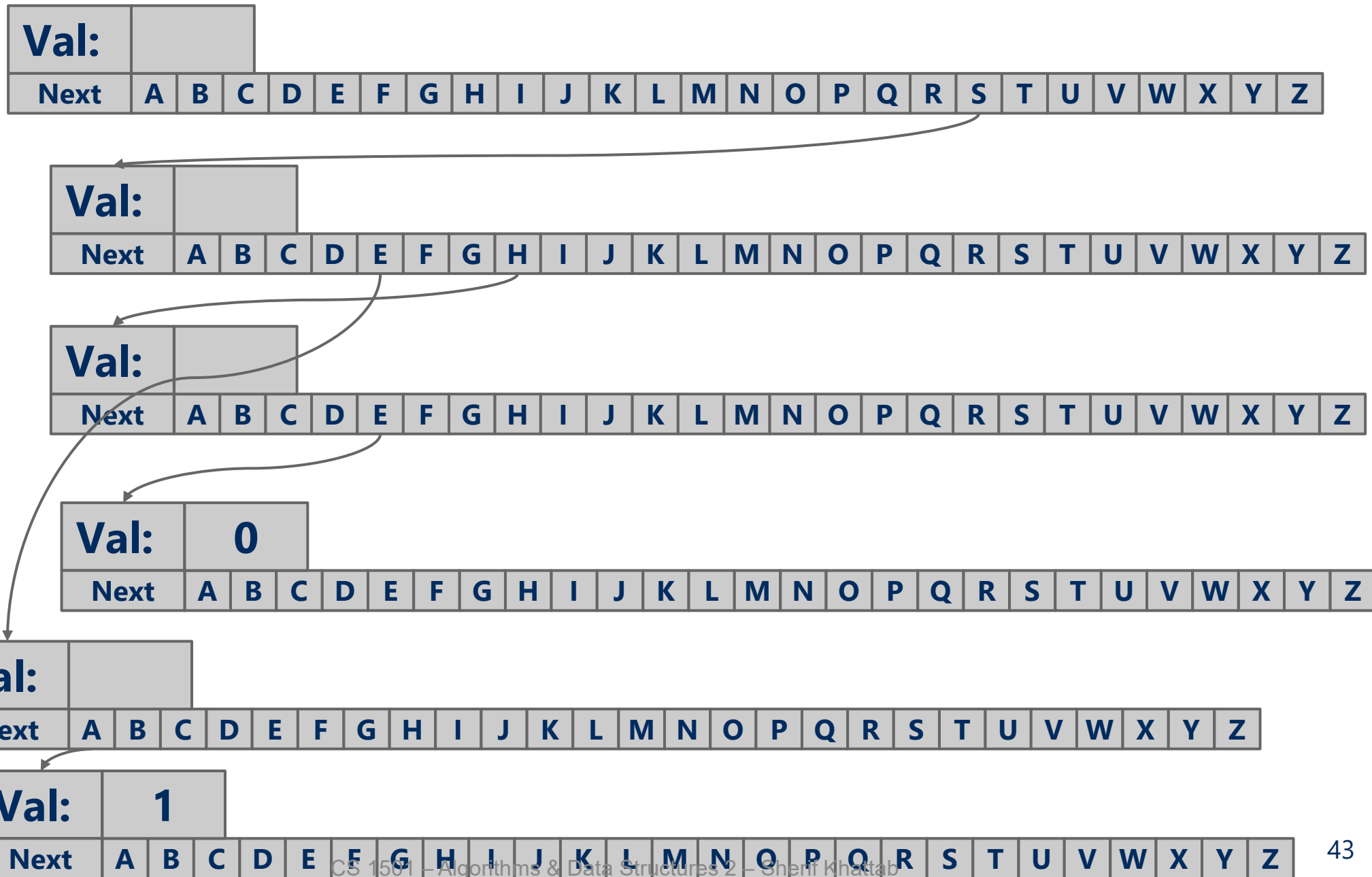
Where R is the branching factor

```
private class Node {  
    private Object val;  
    private Node[] next;  
    private Node(){  
        next = new Node[R];  
    }  
}
```



- Non-null **val** means we have traversed to a valid key
- Again, note that keys are not directly stored in the trie at all

# R-way trie example

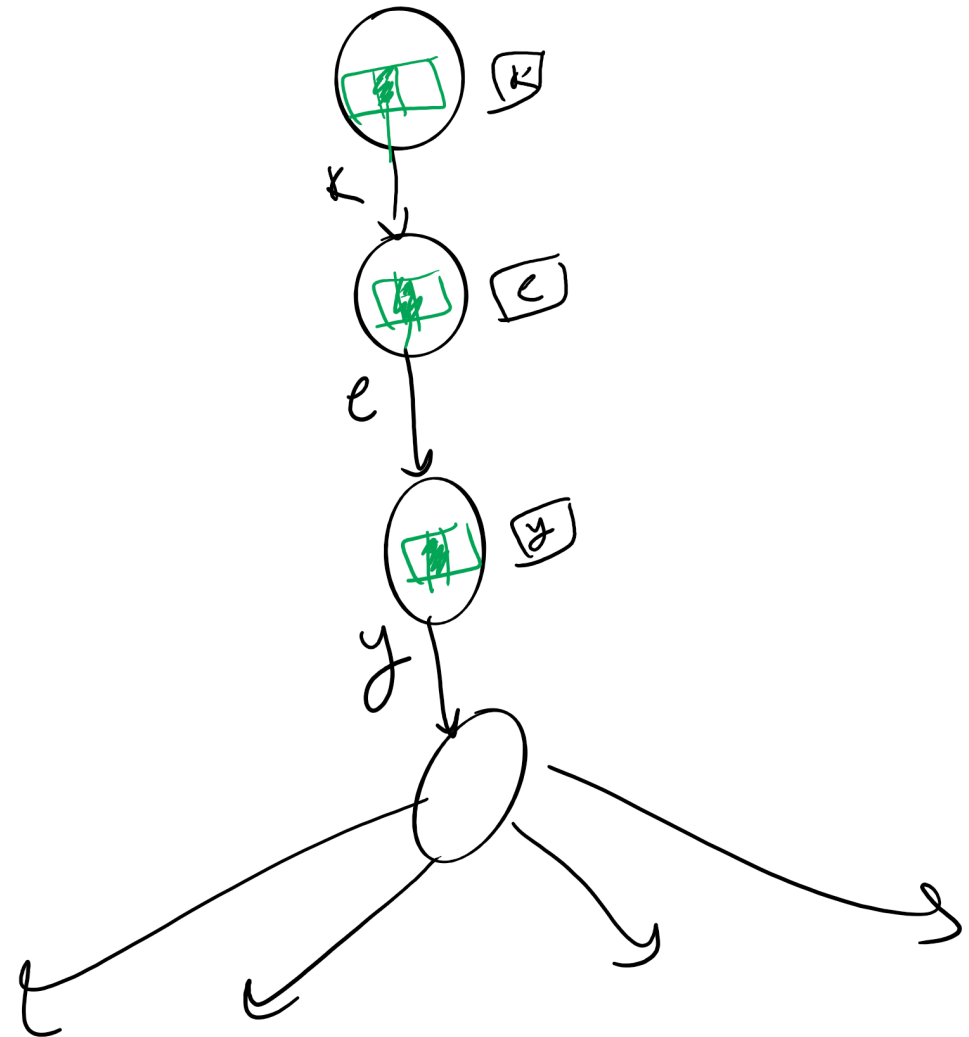


# Summary of running time

	insert	Search hit	Search miss
binary RST	$\Theta(b)$	$\Theta(b)$	$\Theta(\log_2 n)$ on average
multi-way RST	$\Theta(w)$	$\Theta(w)$	$\Theta(\log_R n)$

# R-way RST's nodes are large!

- Considering 8-bit ASCII, each node contains  $2^8$  references!
- This is especially problematic as in many cases, a lot of this space is wasted
  - Common paths or prefixes for example, e.g., if all keys begin with "key", that's  $255 \times 3$  wasted references!
  - At the lower levels of the trie, most keys have probably been separated out and reference lists will be sparse



# Solution: De La Briandais tries (DLBs)

Main idea: replace the array inside the node of the R-way trie with a linked-list

# DLB Nodelets

Two alternative implementations:

```
private class DLBNode {  
    private Object val;  
    private T character;  
    private Node sibling;  
    private Node child;  
}
```

If search terminates on a node with non-null value, key is found; otherwise, not found.

```
private class DLBNode {  
    private Object val;  
    private Character character;  
    private Node sibling;  
    private Node child;  
}
```

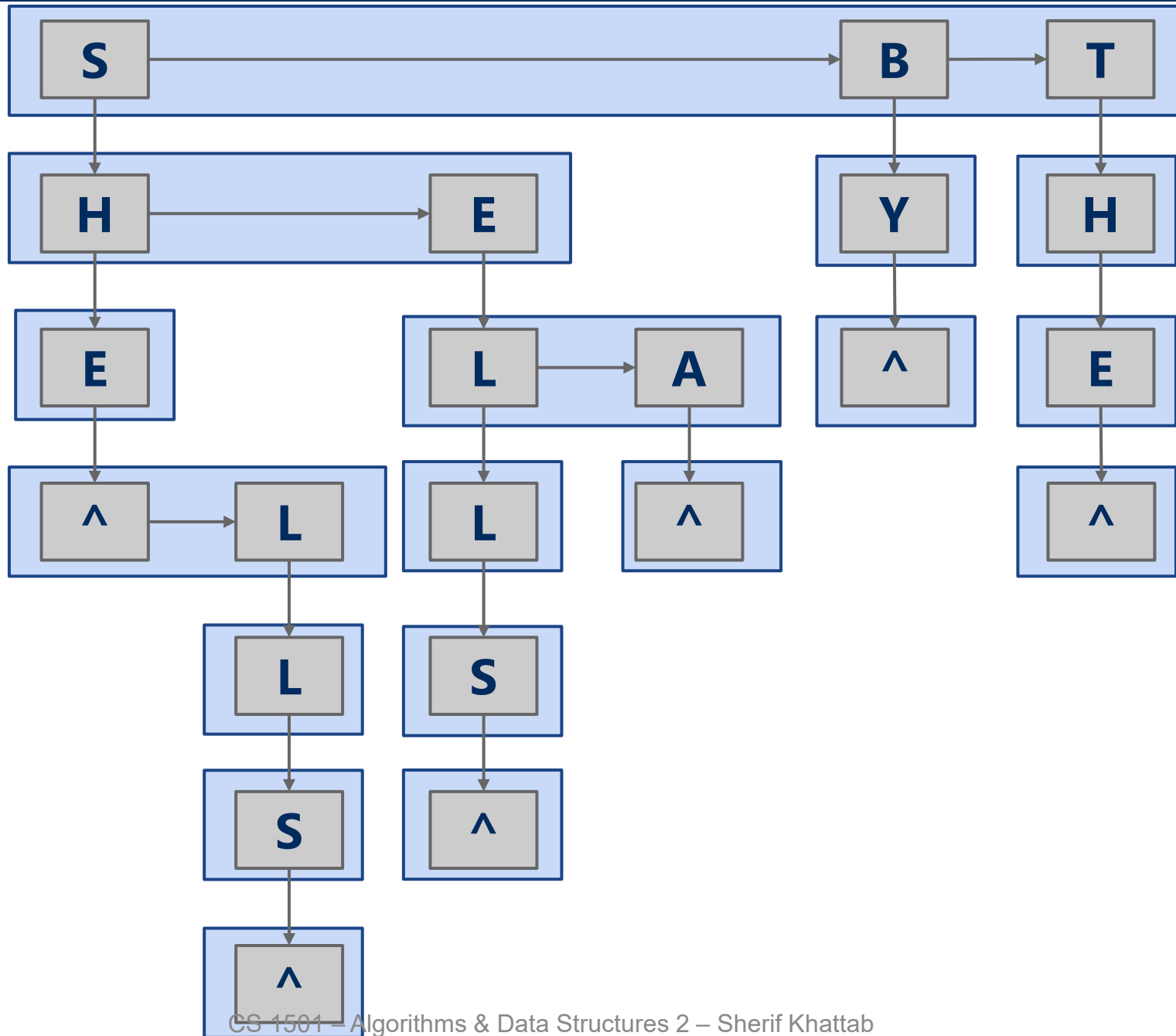
Add a sentinel character (e.g., ^) to each key before add and search  
If search encounters null, key not found; otherwise, key is found

# Adding to DLB Trie

- if root is null, set root  $\leftarrow$  new node
- current node  $\leftarrow$  root
- for each *character*  $c$  in the key
  - Search for  $c$  in the linked list headed at current using sibling links
    - if not found, create a new node and attach as a sibling to the linked list
  - move to child of the found node
    - either recursively or by current  $\leftarrow$  child
- if at last character of key, insert value into current node and return



# DLB Example



# DLB analysis

- How does DLB performance differ from R-way tries?
- Which should you use?

	Search hit insert	
R-way RST	$\theta(w)$	
DLB	$\theta(wR)$	

# Runtime Comparison for Search Trees/Tries

	Search hit	Search miss <i>(average)</i>	insert
BST	$\Theta(n)$	$\Theta(\log n)$	$\Theta(n)$
RB-BST	$\Theta(\log n)$	$\Theta(\log n)$	$\Theta(\log n)$
DST	$\Theta(b)$	$\Theta(\log n)$	$\Theta(b)$
RST	$\Theta(b)$	$\Theta(\log n)$	$\Theta(b)$
$R$ -way RST	$\Theta(w)$	$\Theta(\log n)$	$\Theta(w)$
DLB	$\Theta(w \cdot R)$	$\Theta(\log_{\frac{R}{w}} n)$	$\Theta(w \cdot R)$

# Final notes on Search Tree/Tries

- We did not present an exhaustive look at search trees/tries, just the sampling that we're going to focus on
- Many variations on these techniques exist and perform quite well in different circumstances
  - Ternary search Tries
  - R-way tries without 1-way branching
- See the table at the end of Section 5.2 of the text